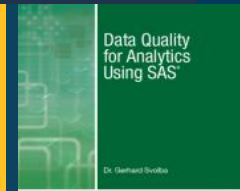
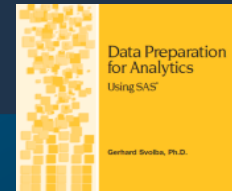
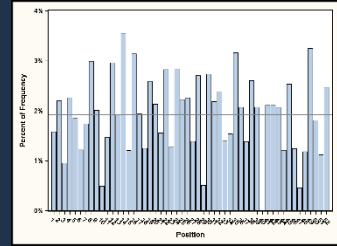


Gewinnen beim Monopoly® Spiel – Alles nur Zufall? Oder gibt es doch ein paar Muster, die man kennen sollte?

21. KSFE, Krefeld, 9.-10. März 2017

Gerhard Svolba



Die Vortragsfolien sind online
→ Google: Gerhard SAS Samples

SAS Analytik Plattform

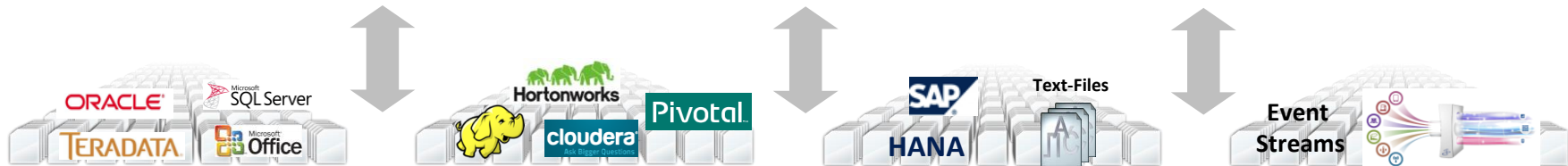
Unterschiedliche Layer aus konzeptioneller Sicht

SAS Analytik Plattform

Business Intelligence

Advanced Analytic

Datenmanagement



SAS Analytik Plattform

Advanced Analytic Layer

SAS Analytik Plattform

Business Intelligence



Data Mining



Statistical Analysis



Forecasting



Text Analytics



Optimization &
Simulation

Datenmanagement



Mathematische Programmierung mit SAS

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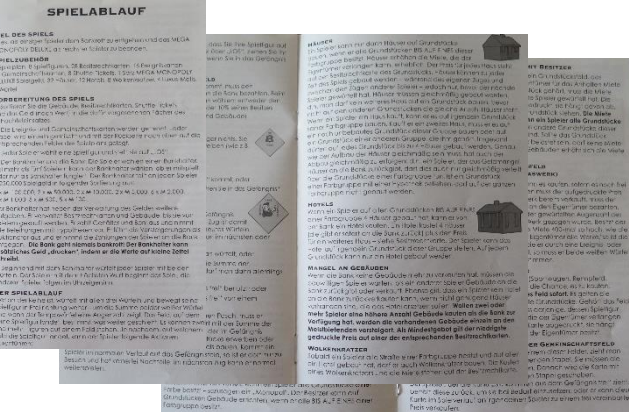
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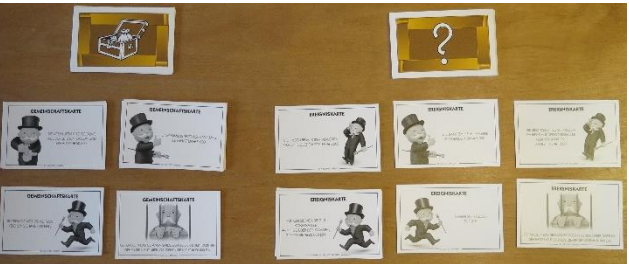
17

10 

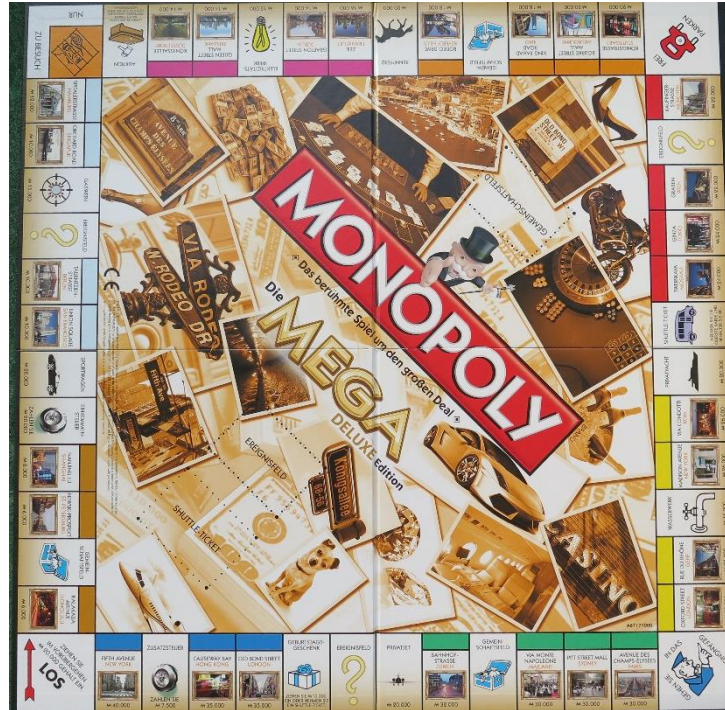
Das Monopoly Spiel ist ein komplexes System



Komplexe Regeln



Zusätzliche Anweisungen



Rahmenwerk von Möglichkeiten und Ereignissen



Monetäre Dimension



Dynamische Komponenten



Zufällige Komponenten

Wichtige Fragestellungen

- Wie ist die Verteilung der Besuchshäufigkeiten auf die Felder am Brettspiel?
- Welche Felder sind am profitabelsten?
- Welche Felder haben die höchste Variabilität im Profit?
- Diese Fragen können auf viele andere Simulationsstudien von komplexen Fragestellungen übergeleitet werden.

Platzierung der Spielfigur - Einflussgrößen



Würfel-Summe



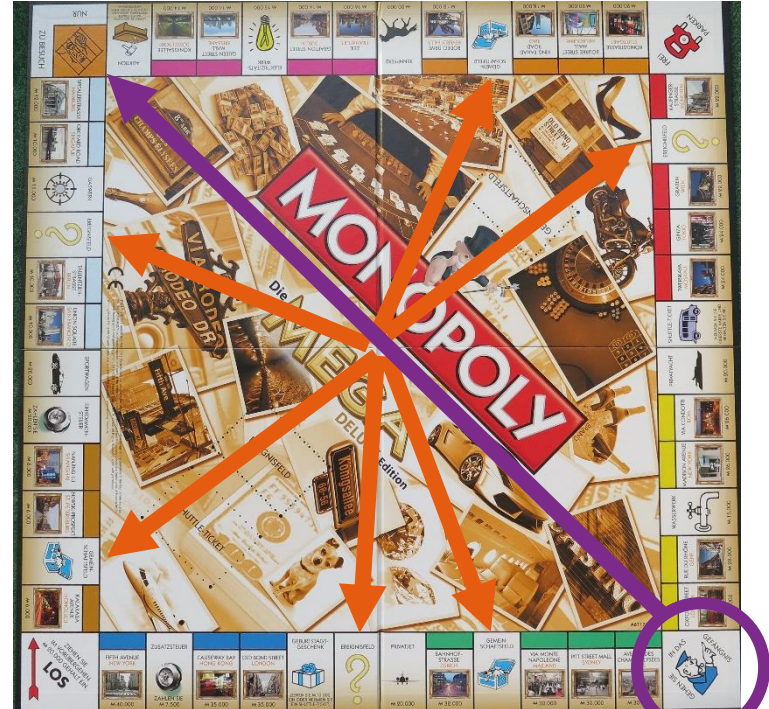
Gehe ins Gefängnis!



Ereignis-Felder



Speed-Würfel

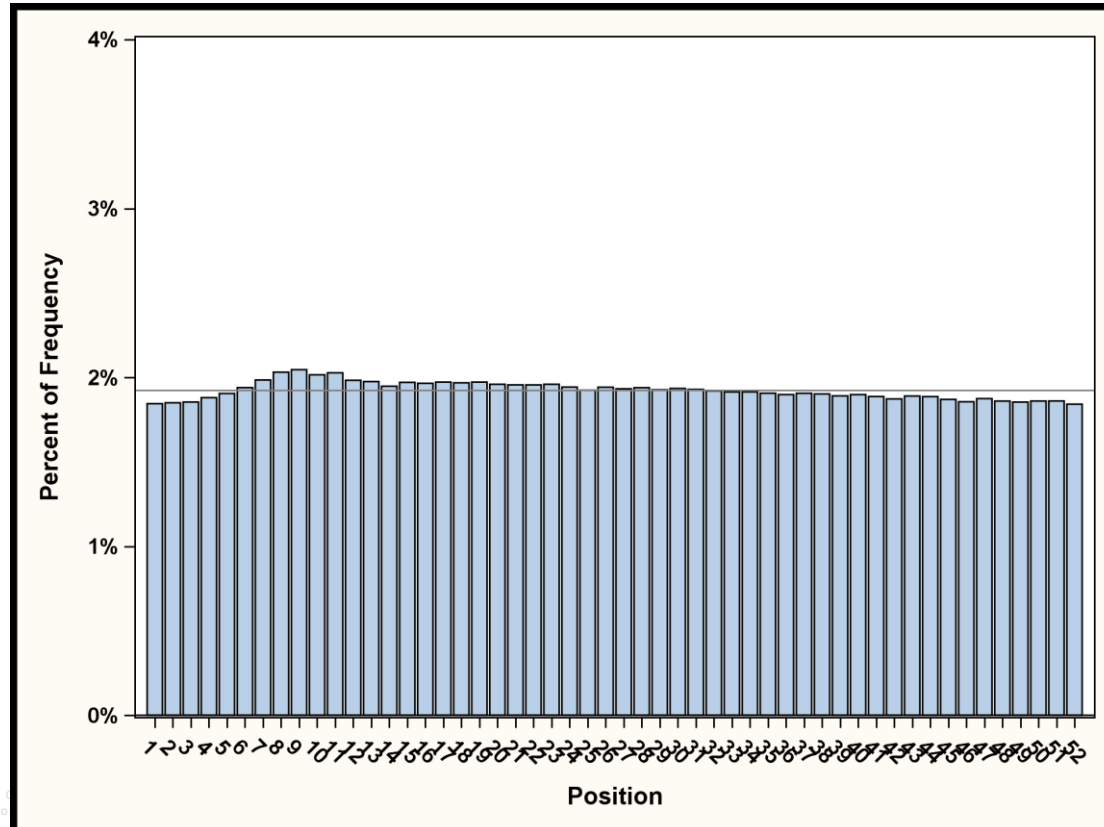


Nur Würfeln - Fast eine Gleichverteilung

10000 Simulationen, 70 Runden, 4 Spieler



Würfel-
Summe



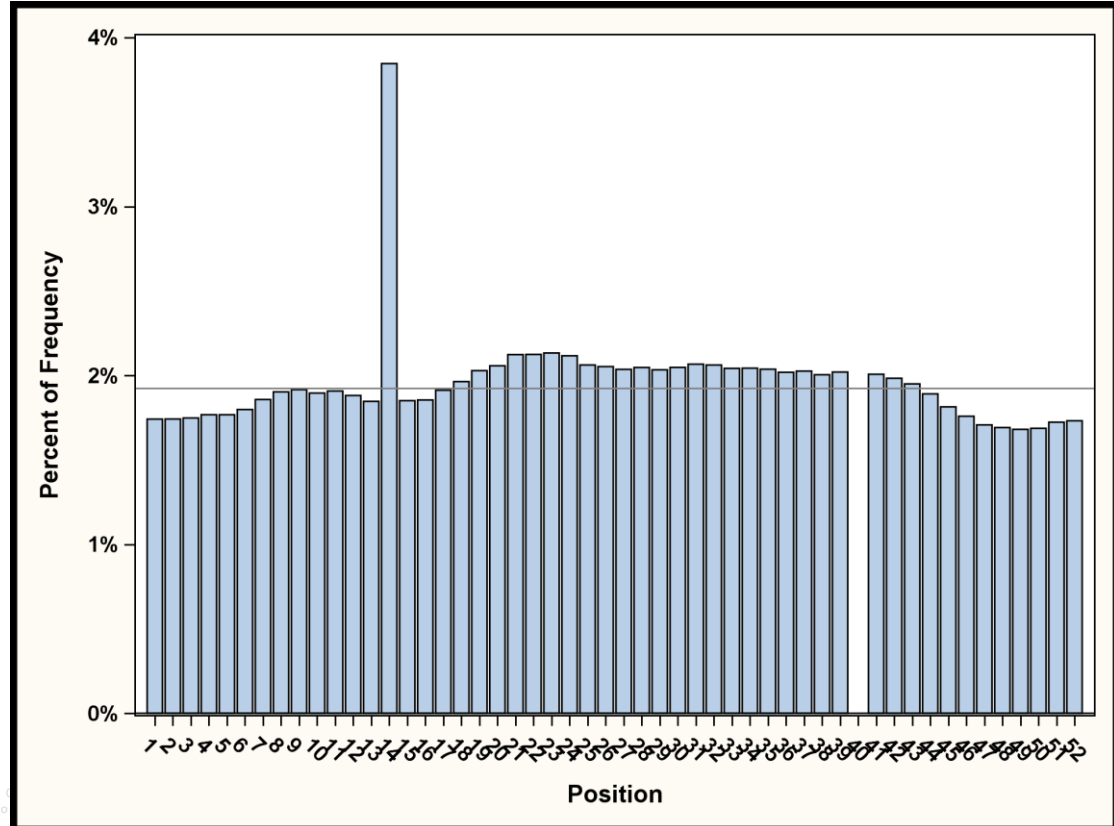
Alle Feld-40 Besuche werden auf Feld 14 umgesetzt



Würfel-
Summe



Gehe ins
Gefängnis!



Ereignisfelder positionieren die Spielfigur um



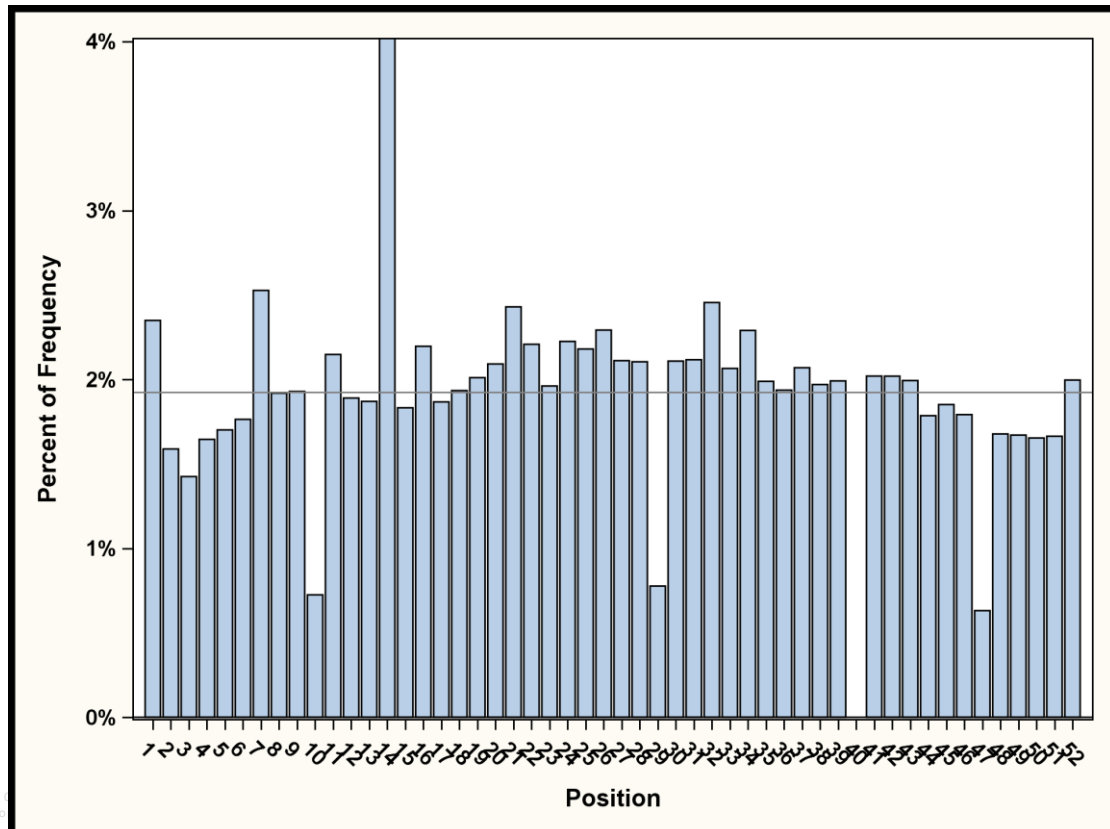
Würfel-
Summe



Gehe ins
Gefängnis!



Ereignis-
Felder



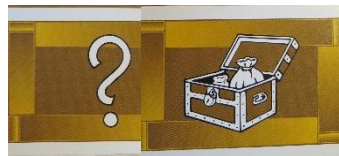
Der Speed-Würfel erzeugt zusätzliche Variabilität



Würfel-Summe



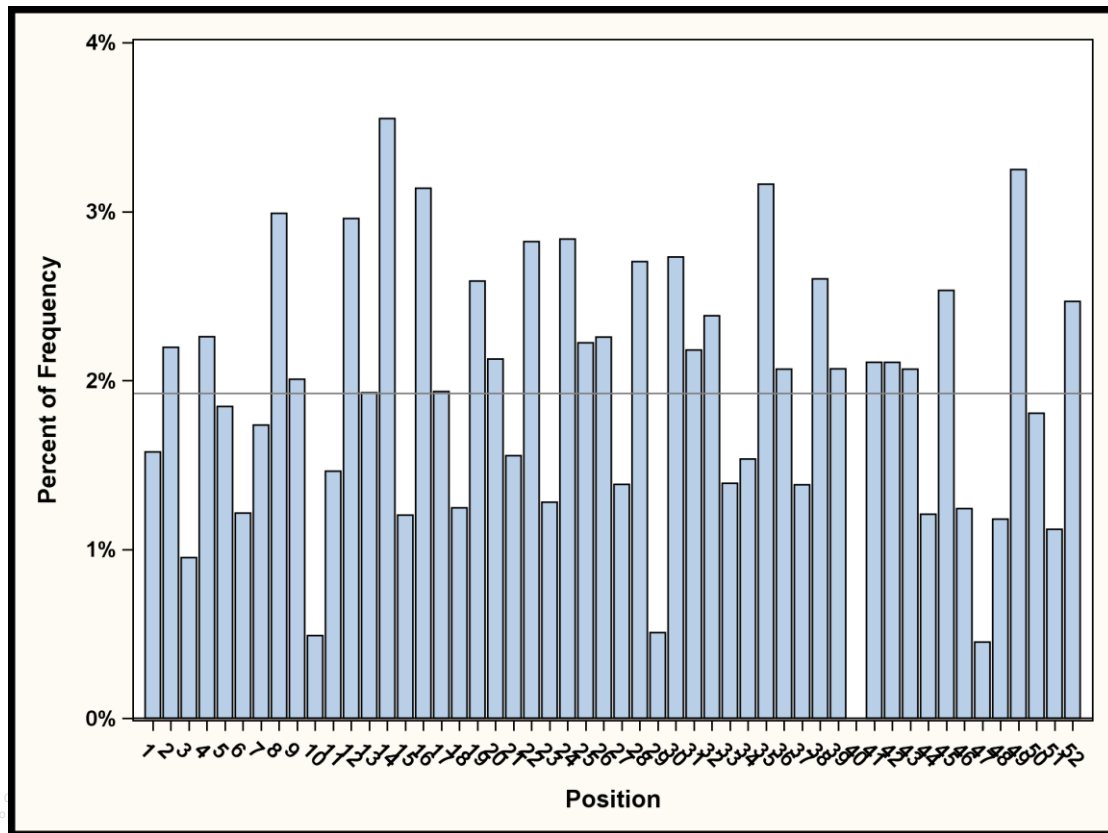
Gehe ins Gefängnis!



Ereignis-Felder

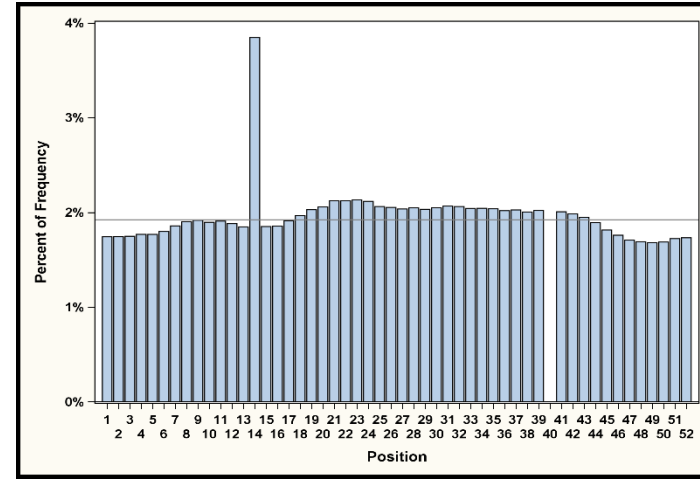


Accelerator Dice



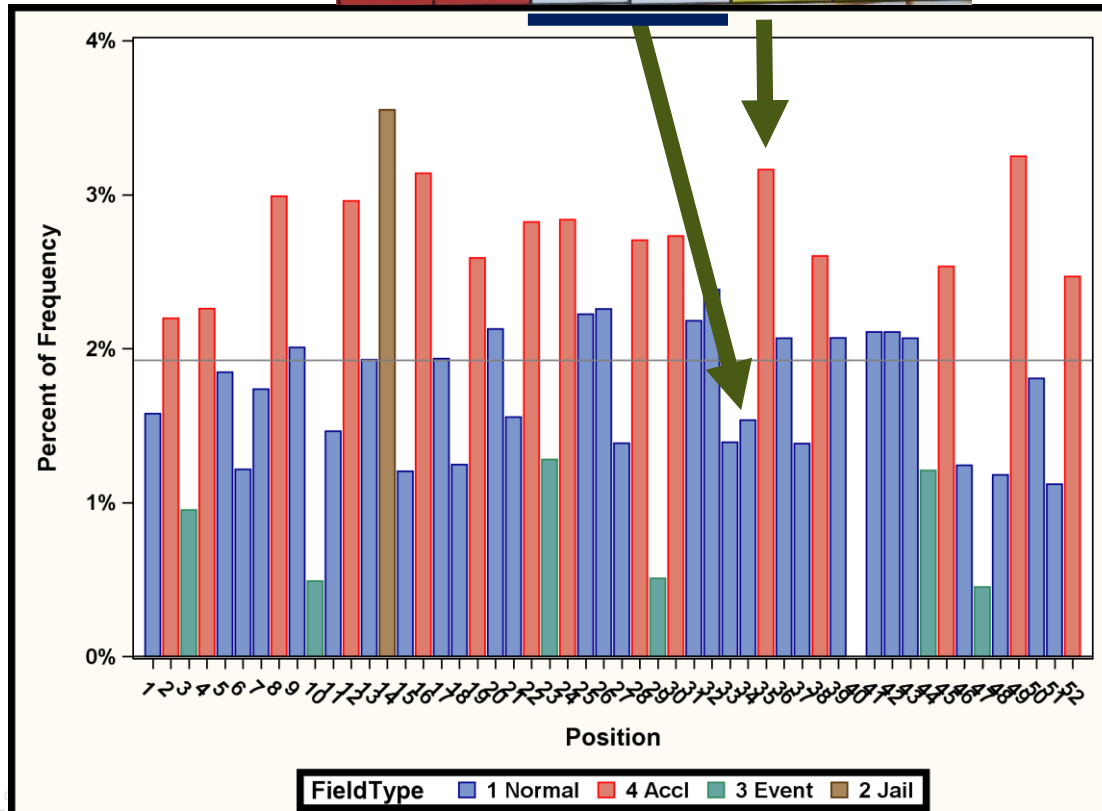
SAS Code für das Histogramm

```
proc sgplot data=PlayerPosition_MNP1;  
  vbar Position / stat=percent_MNP1;  
  yaxis max=0.04;  
  xaxis values=(1 to 52 by 1) fitpolicy=stagger;  
  refline 0.01923 /axis=y;  
run;
```

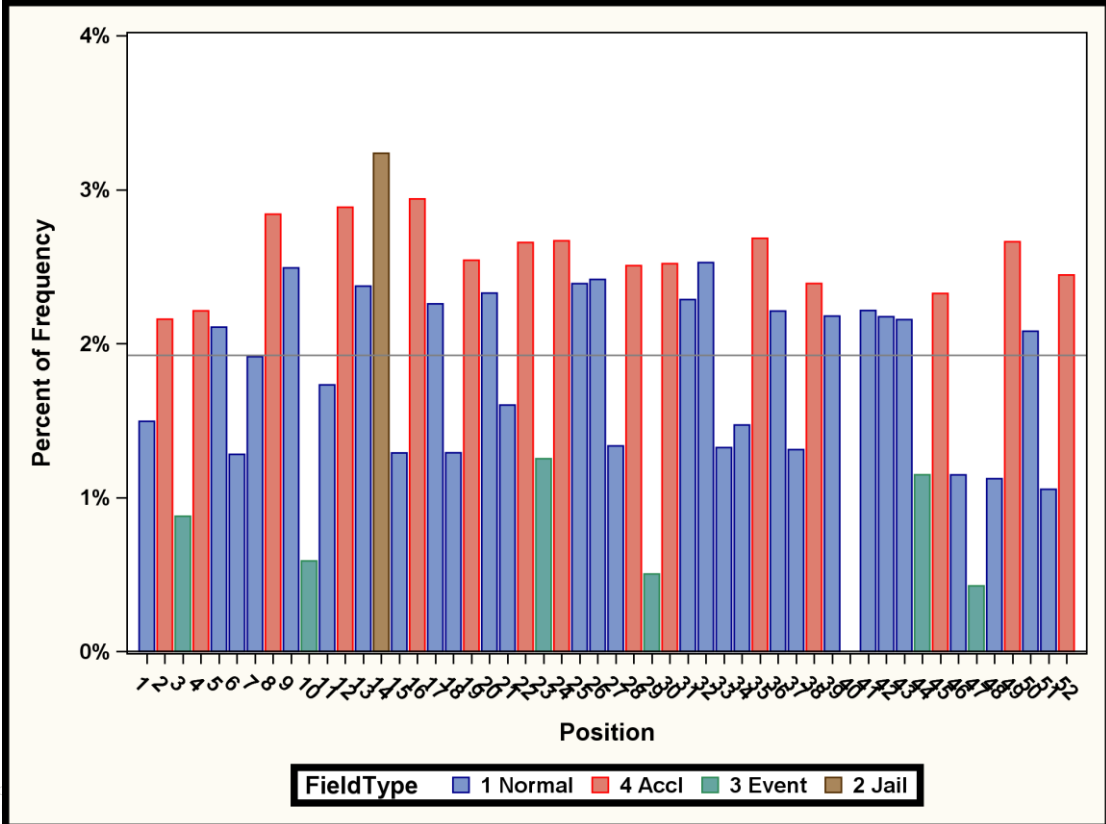


Beispiel für eine Umplatzierung

- Wenn der Speed-Würfel den Monopoly-Mann zeigt:
- Ziehe weiter bis zum nächsten freien Grundstück
- Ziehe weiter zum nächsten Grundstück, wenn schon alle verkauft sind.



Effekt des Speedwürfels nach 20 Runden

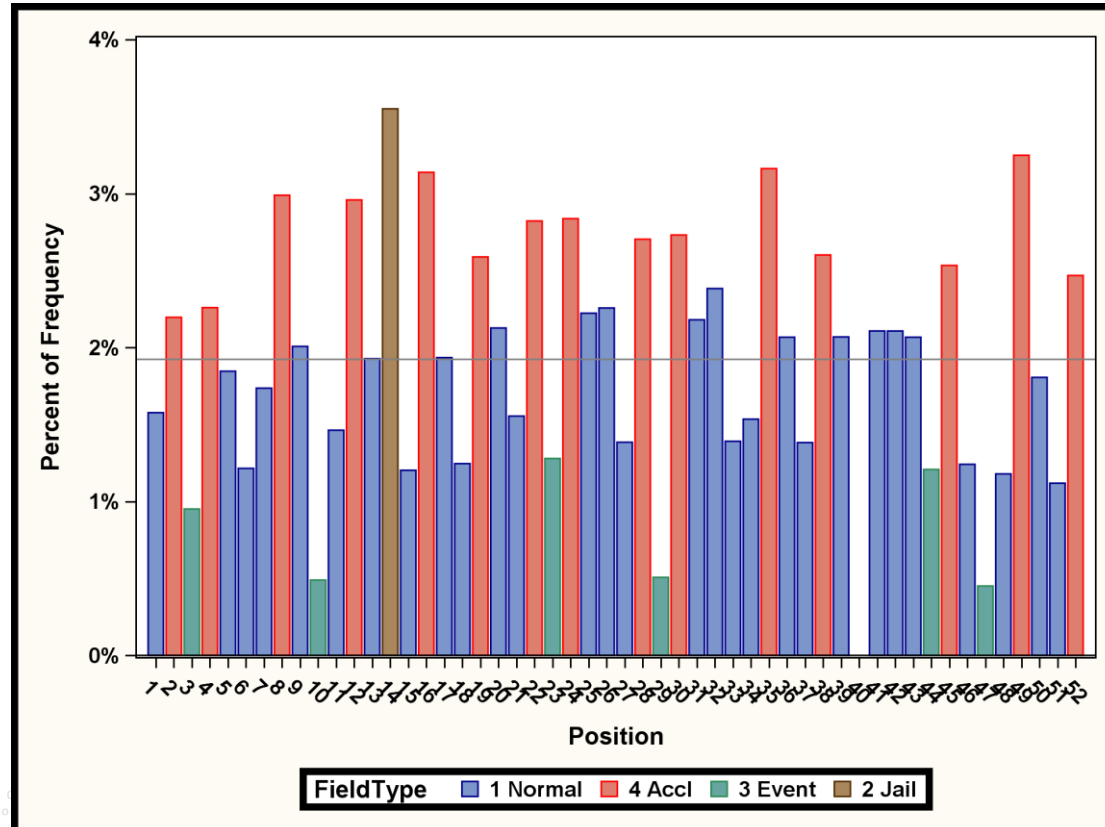


Effekt des Speedwürfels nach 70 Runden

„Dynamische Komponente“

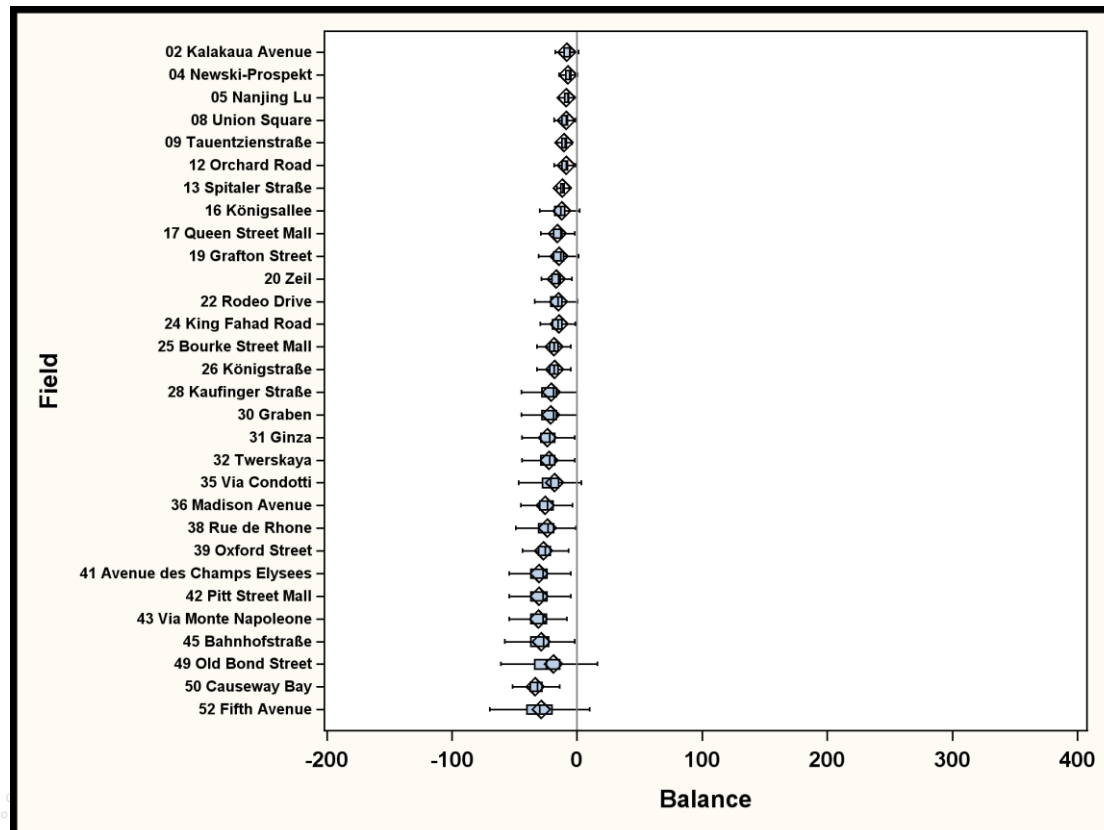
Effekt der Regel verändert sich im Laufe des Spiels

Dynamische
Komponente



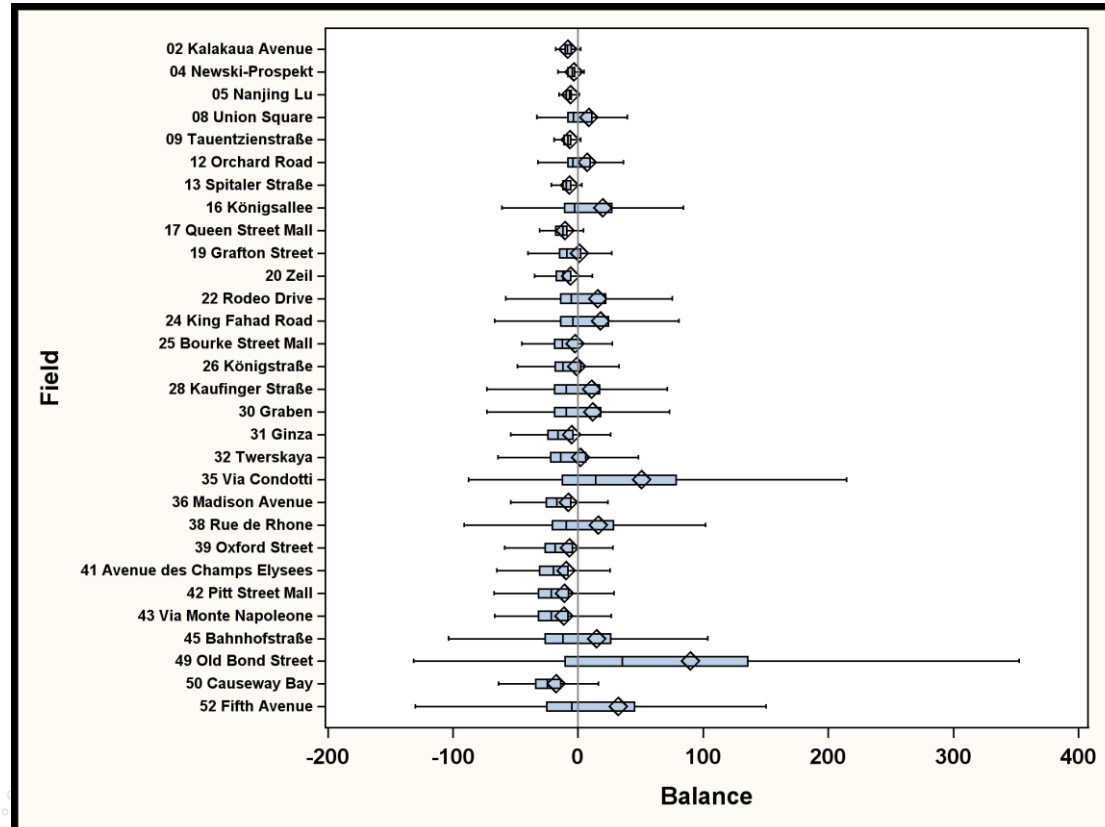
Profitabilitätsverteilung nach 40 Runden

Profitabilitätssimulation gibt Einblicke in die Verteilung des Profits pro Grundstück



Profitabilitätsverteilung nach 70 Runden

Die erwartete Dauer des Spiels hat Einfluss auf die Profitabilität der unterschiedlichen Felder



Implementierung in SAS

Überblick

Declare and Initialize

Loop over Scenarios (Games)

Initialize Scenario

Loop over Rounds and Players

Generate Random Numbers

Follow Instructions

Generate Deterministic/Random Behaviour

Update Counts, Values, States

Output the Record

End Loop

End Loop

Prepare Analysis Data: Aggreg., Transpose, Enrich

Calculate Output Statistics, Display Output

```
data Monopoly;
  array PlayerPos {4} PlayerPos1 - PlayerPos4;
  do Game = 1 to 10000;
    do Round = 1 to 70;
      do Player = 1 to 4;
        Dice1 = ceil(rand('Uniform')*6);
        if PlayerPos[Player]=40 then
          PlayerPos[Player]=14;

        output;
      end;
    end;
  end;
run;

proc transpose data=Monopoly ...;run;
proc sgplot data=Monopoly_TP;
```

Verwendung von ARRAYS in einem SAS DATA Step

```
Array PlayerPos      {&players} PlayerPos1      - PlayerPos&players.      ;
Array PlayerBalance  {&players} PlayerBalance1 - PlayerBalance&players.      ;
Array PlayerIncome   {&players} PlayerIncome1  - PlayerIncome&players.      ;
Array PlayerExpense  {&players} PlayerExpense1 - PlayerExpense&players.      ;
Array Field           {52}      Field1          - Field52                ;
Array FieldSetup      {52}      FieldSetup1     - FieldSetup52           ;
Array FieldRevenue     {52}      FieldRevenue1   - FieldRevenue52;
Array FieldCost        {52}      FieldCost1      - FieldCost52            ;
Array FieldBalance     {52}      FieldBalance1   - FieldBalance52;
```

- **PLAYERPOS[2]** denotes the position of player 2 and refers to variable **PLAYERPOS2**
- **PLAYEREXPENSE[Player]** refers to the player expense variable for the respective player.
- **FIELDREVENUE[PLAYERPOS[PLAYER]]** refers to the revenue of that field, where the actual **PLAYER** is currently positioned.

Verwenden eines SAS Formats als Lookup Tabelle

	Field	M0	M1	M2	M3	M4
1	2	0.2	1	3	9	16
2	4	0.4	2	6	18	32
3	5	0.5	3	8	24	36
4	8	0.6	3	9	27	40
5	9	0.6	3	9	27	40
6	12	0.6	3	9	27	40
7	13	0.8	4	10	30	45
8	16	1	5	15	45	62
9	17	1	5	15	45	62
10	19	1	5	15	45	62
11	20	1.2	6	18	50	70

```
data k0;  
  set Property_CostRevenue;  
  fmtname = 'k0_';  
  type = 'i';  
  rename field=start k0=label;  
run;  
  
proc format cntlin=k0 library=work;  
run;
```

Verwenden der Formate und Arrays

```
if Field[PlayerPos[Player]] = 0 then do;  
  Field[PlayerPos[Player]] = Player;  
  FieldCost[PlayerPos[Player]] = input(PlayerPos[Player], K0_.);  
  FieldSetup[PlayerPos[Player]] = 0;  
  PlayerExpense[Player] =  
    PlayerExpense[Player] + input(PlayerPos[Player], K0_.);  
end;
```

Bewegung der Spielfigur

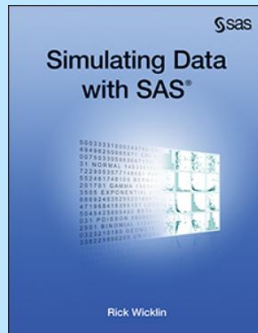
```
do Round = 1 to &Rounds;
    do Player = 1 to &players;
        Dice1 = ceil(rand('Uniform')*6);
        Dice2 = ceil(rand('Uniform')*6);
        Dice3 = ceil(rand('Uniform')*6);
    *** Dice3 shows a number Number that shall be added to the sum;
    if      Dice3 <= 3 then DiceSum = sum(Dice1,Dice2,Dice3);
    else      DiceSum = sum(Dice1,Dice2);

    PlayerPos[Player] + DiceSum;
    PlayerPos[Player] = mod(PlayerPos[Player]-1,52)+1;
```

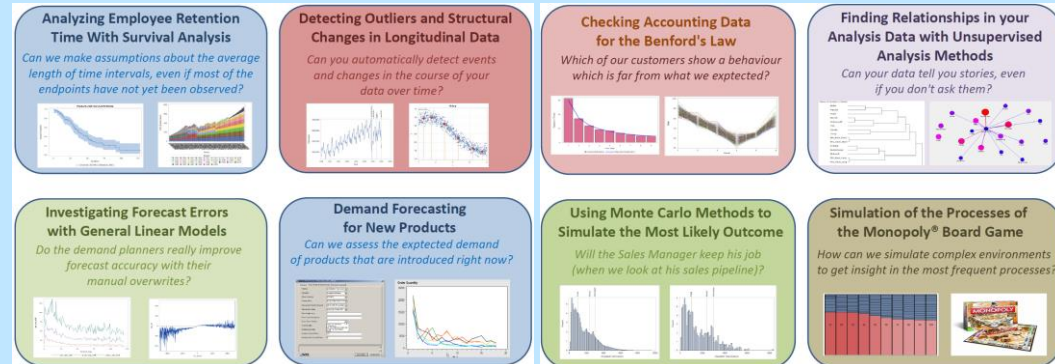
Links

- KSFE 2016: Simulationen und Mathematische Programmierung mit SAS, Gerhard Svolba

- Rick Wicklin:
Simulating Data with SAS
<http://support.sas.com/publishing/authors/wicklin.html>



- Gerhard Svolba: **Applying Data Science: Business Case Studies Using SAS** (SAS Press, expected 2017)



[http://www.sascommunity.org/wiki/Applying_Data_Science -
Business Case Studies Using SAS](http://www.sascommunity.org/wiki/Applying_Data_Science_-_Business_Case_Studies_Using_SAS)

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GERHARD SVOLBA, PhD, is a principal solutions architect and analytic expert at SAS Institute Inc. based in Austria, where he specializes in application analytics and machine learning in different business and research domains. His project experience ranges from business and technical conceptual considerations to data preparation and analytic modeling across industries. He is the author of *Data Preparation for Analytics Using SAS®* and *Data Quality for Analytics using SAS®*, and he teaches the SAS training course "Building Analytic Data Marts." Gerhard likes to be in touch with customers and to exchange ideas about data science, machine learning, as well as data preparation and data quality in the context of analytics.



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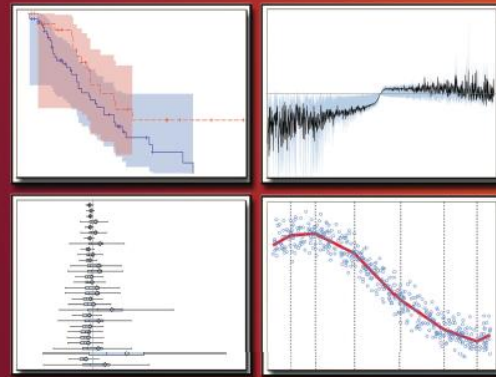
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